



**See More,  
Learn More,  
Tell More**

**(briefing)**



**Tim Menzies**  
West Virginia University  
[tim@timmenzies.net](mailto:tim@timmenzies.net)





# Problem



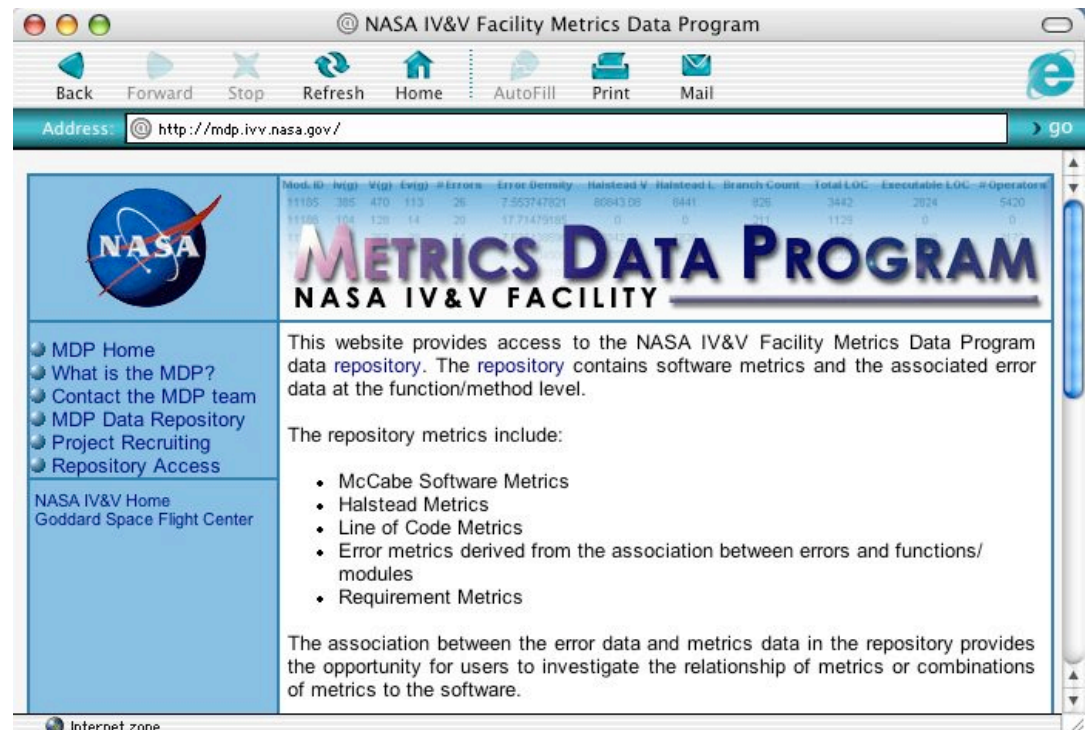
- **Mountains of data**
  - Seek “the diamonds in the dust”
- **We have many do-ings**
  - But what are we learn-ing?
- **What general lessons about software quality assurance can we offer NASA?**
- **Problem of external validity**
  - It worked “there” but will it work “here”?



# Approach



- **while not (( end of time OR  
end of money ))**
  - chase data sets
  - extract cost-benefit patterns from data
  - check the stability of those patterns
  - report stable conclusions
- **Product metrics:**
  - NASA metric's data program
  - Goddard project
  - Flight simulators
- **Process metrics:**
  - cost estimation data from JPL
    - Now spun off into a project with Jairus Hihn
  - SILAP (IV&V effort potential model)



<http://mdp.ivv.nasa.gov>

Now with 10+ projects

← and many more soon



# Importance/ Benefits



## •Generally:

- NASA does a lot of software
- What guidance should we offer developers?
- How good is that guidance
  - Has that guidance been certified?
  - Do we know how general are those guidelines?



# Relevance To NASA



Research Heaven,

- **Data comes from NASA**

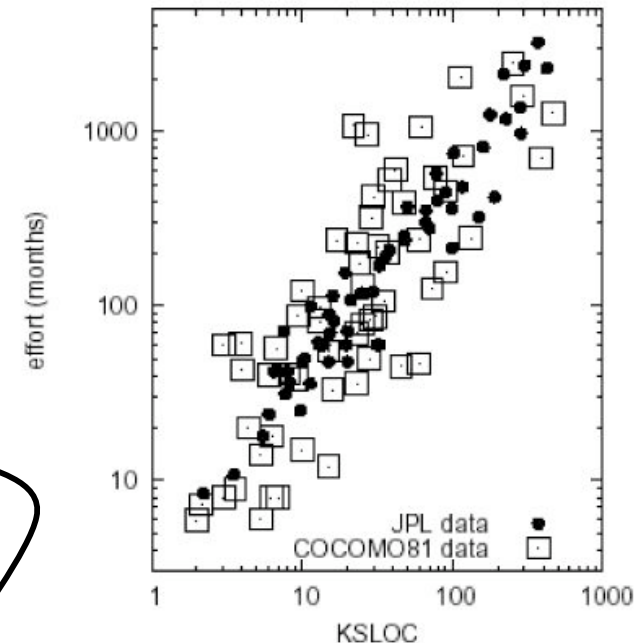
- Process metrics:

- JPL project data
    - IV&V effort potential data

- Product metrics

- Defect logs from multiple NASA centers
    - Flight simulator data

- **Conclusions apply to NASA projects**



project	# modules	% with defects	language	developed at	notes
CM1	496	9.7%	C	location 2	a NASA spacecraft instrument
JM1	10885	19%	C	location 3	real-time predictive ground system: uses simulations to generate the predictions
KC1	2107	15.4%	C++	location 4	storage management for receiving and processing ground data
KC2	523	20%	C++	location 4	science data processing; another part of the same project as KC1; different personnel to KC1. shared some third-party software libraries as KC1, but no other software overlap.
PC1	1107	6.8	C	location 5	support tools
Total	15118				



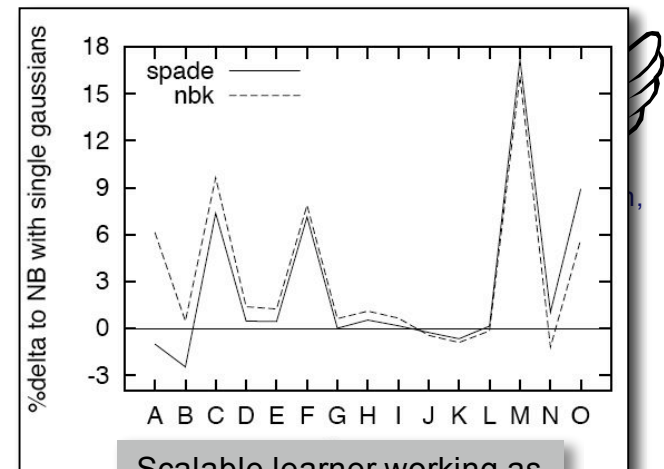
# Accomplishments

## • Before:

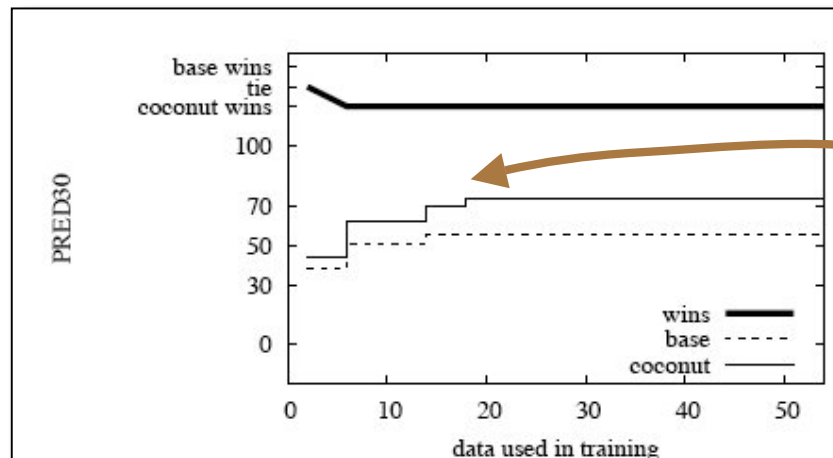
- Can automatically learn defect detectors from error logs
- Those defect detectors from code are much BETTER than previously believed
  - Yes, false negative, but adequate to good detection probabilities
  - (Enough) stability across multiple projects

## • Now:

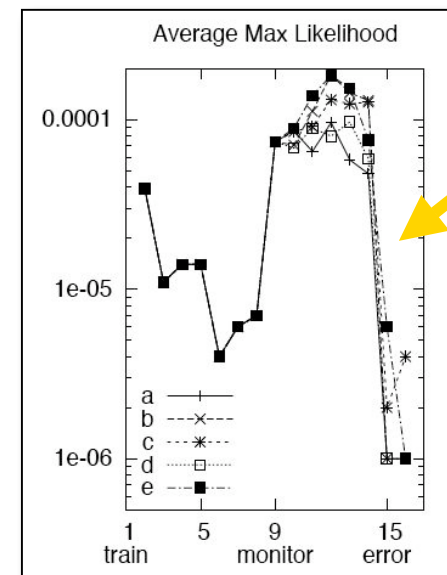
- Can automatically learn software cost models
  - AND determine how much data is required to do that
- Can scale up to HUGE data sets
- Can determine when a learned theory goes “out of scope”
- See also “SPOT/CUBE” in “martha”



Scalable learner working as well as state-of-the-art, non-scalable, alternative



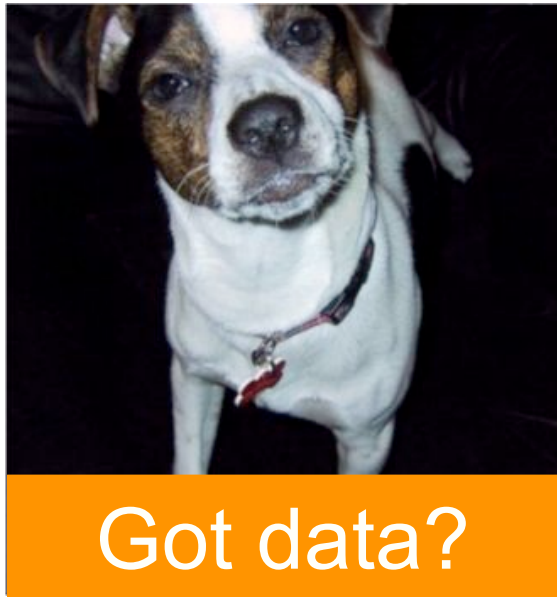
When we have seen enough data to learn a good cost model



Where a learner has left the zone where it was certified



# Next Steps



- **Data mining needs data**
  - Got data?
    - Then meet your new best friend
- **Current plans**
  - More defect data studies
    - Dozens, not just 5, data sets
    - Check effectiveness and stability?
  - Release of the generalized toolkits
    - Tutorials
    - manuals
  - Generalized anomaly detectors
    - The “selection bias” problem
  - Synergies with other SARP data mining projects